

# The Transmission of International Shocks to CIS Economies: A Global VAR Approach

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# Introduction

- Commonwealth of Independent States (CIS) – a platform for coordinating regional economic and political developments
  - Heterogeneous emerging economies
  - Deeply interrelated
  - Closely connected to developed as well as emerging economies
  - Vulnerable to international shocks
- International shocks faced by individual country can be amplified through various spillover channels – **multilateral perspective is crucial**

# Previous Literature

- CIS – sensitive to the US and euro area shocks
  - [Feldkircher \(2013\)](#) 1% shock to EA or US output increases CIS's GDP by 0.9% and 0.7%, respectively
- CIS – connected to emerging world, e.g., China
  - [Feldkircher & Korhonen \(2012\)](#) 1% shock to Chinese output transmits to about 0.2% rise in CIS's output
- Regional and Russian-specific shocks are significant for CIS
  - [Alturki & al. \(2009\)](#) 1% shock to Russian GDP is associated with a 0.35-0.45 % increase in CIS's GDP
  - Evidence on important spillovers for inflation and exchange rate developments, see [Comunale & Simola \(2016\)](#), [Faryna \(2016\)](#), [Charemza et al. \(2009\)](#), [Dreger & Fidrmuc \(2011\)](#)

# Stylized Facts – output correlations

Pre-crisis 2001-2008	USA	EA	CHINA	RUSSIA	CIS
USA	1	0.36	0.28	0.52	0.14
EA	-	1	0.66	0.66	0.17
CHINA	-	-	1	0.85	0.19
RUSSIA	-	-	-	1	0.25
CIS	-	-	-	-	0.08*

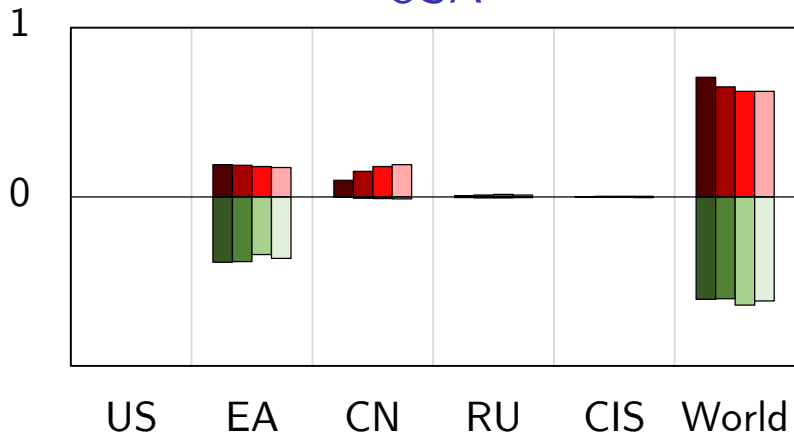
Post-crisis 2009-2016	USA	EA	CHINA	RUSSIA	CIS
USA	1	0.87	-0.31	0.70	0.30
EA	-	1	-0.20	0.61	0.25
CHINA	-	-	1	0.22	0.30
RUSSIA	-	-	-	1	0.58
CIS	-	-	-	-	0.41*

\* shows average cross-country correlations within CIS economies

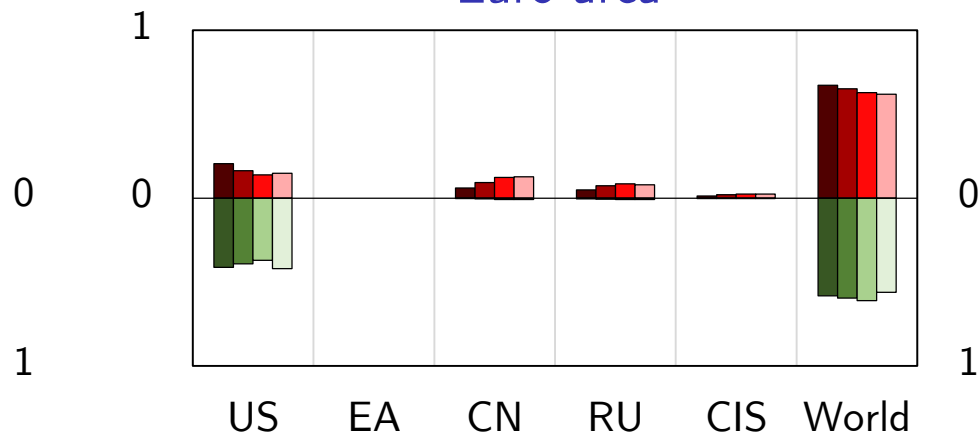
Source: World Bank Open Data - World Development Indicators

# Stylized Facts – trade and financial linkages (1)

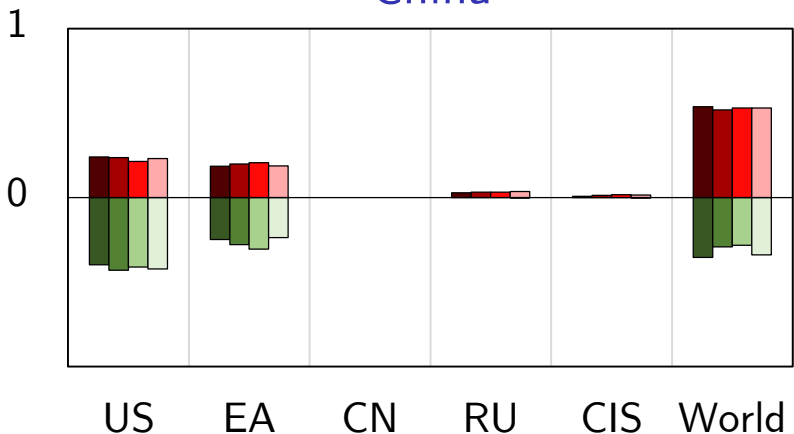
## USA



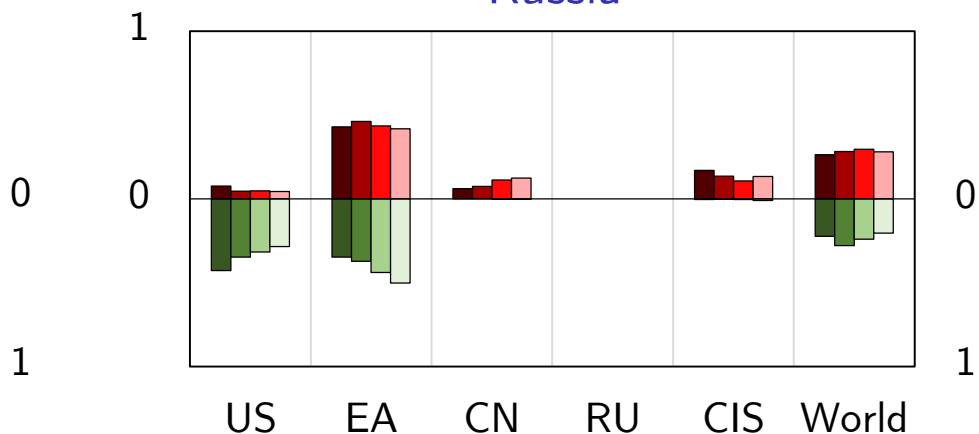
## Euro area



## China



## Russia



Trade (left - red)

Financial (right - green)



2001-2004



2005-2008

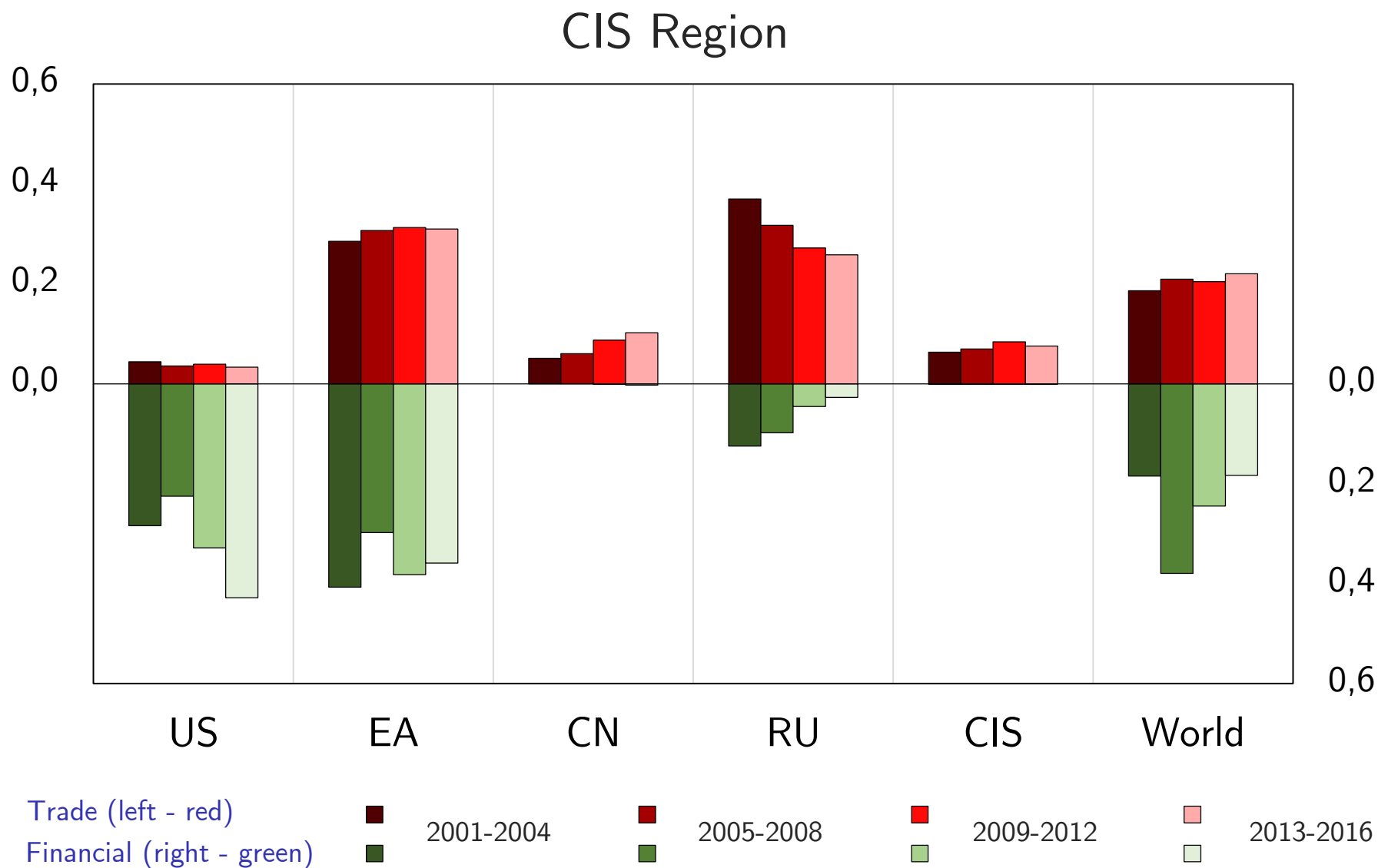


2009-2012



2013-2016

# Stylized Facts – trade and financial linkages (2)



# This paper:

- Employs Global Vector Autoregression (GVAR) model similar to [Feldkircher \(2013\)](#), [Feldkircher & Korhonen \(2012\)](#)
  - Accounts for cross-country interdependencies
- Examines the response of CIS to foreign and regional shocks
  - Output shocks in the US, EA, China, Russia, and CIS
  - Oil price shock
- Explores how those responses evolved over past decades as the international linkages – [trade and financial relations](#) – have experienced notable changes
  - In the spirit of [Cesa-Bianchi et al. \(2012\)](#)

# Agenda

- Introduction
- Analytical Framework
  - GVAR model
  - The Data
  - Model Setup
- Results
  - Response to Output Shocks
  - Response to Oil Price Shock



# Analytical Framework

- Modeling complex interdependent world through Vector Autoregressions (VAR):
- Panel VAR (PVAR)
  - Cross-country heterogeneity, dynamic and static interdependencies
  - Dimensionality and shock identification problems may arise
  - For small number of countries – potential omitted variable bias
  - If dynamic and static interdependencies are disabled – omitted higher order spillover channels
- Global VAR (GVAR)
  - VARs for individual countries combined through weight matrix
  - All features of PVAR
  - Solves dimensionality problem
  - Allows for accurate estimation of higher-order spillover channels

# The GVAR Model

- GVAR – combination of individual VARX\*
  - Presented in Pesaran, Schuermann & Weiner (2004)
  - Further developed in D'ees, di Mauro, Pesaran and Smith (2007)

$$\Phi_i(L, p_i)X_{it} = a_{i0} + \Lambda_i(L, q_i)X_{it}^* + \Psi_i(L, q_i)D_t + u_{it}$$

- $X_{it}$  – domestic variables
  - $X_{it}^*$  – foreign variables
  - $D_t$  – global variables
  - $u_{it} \sim iid(0, \Sigma_{ii})$
- Cross-country data usually shares common stochastic trend
  - cointegration relationships in each individual model – VECMX\*

# The GVAR Model (2)

- Foreign variables – weighted domestic counterparts

$$X_{it}^* = \sum_{j=1}^N \omega_{ij} X_{it},$$

- $\omega_{ij}$  – country specific weights such that  $\sum_{j=1}^N \omega_{ij} = 1$

- Dominant Unit Model for global variables

$$\Psi(L, q) D_t = a_0 + \Lambda(L, q^\#) X_t^\# + u_t^d,$$

$$X_{it}^\# = \sum_{j=1}^N \omega_j^\# X_{it},$$

# The Data

- 30 economies (about 80% of world PPP-GDP):

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## Commonwealth of Independent States (CIS)

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Azerbaijan	Belarus	Georgia*	Kazakhstan	Ukraine*
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## Shock originating economies

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USA	Euro area (modeled as region)	China	Russia
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## Rest of the world

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Australia	Czech Republic	India	Mexico	Romania
Brazil	Denmark	Indonesia	New Zealand	Sweden
Bulgaria	Hungary	Japan	Norway	Turkey
Canada	Iceland	Korea	Poland	United Kingdom
Chile				

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\* Not official members of CIS

# The Data (2)

- Time span: 2001q1 – 2016q4

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## Domestic variables - $X_{it}$

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Real output

$$y_{i,t} = \ln(RGDP_t)$$

Consumer inflation

$$dp_{i,t} = \ln(CPI_t) - \ln(CPI_{t-1})$$

Interest rate

$$r_{i,t} = NIR_t$$

Real exchange rate

$$e_{i,t} = \ln(NFX_t/CPI_t)$$

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## Foreign variables - $X_{it}^*$

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Foreign output ( $y^*$ )

$$y_{it}^* = \sum_{j=1}^N \omega_{ij}^T y_{jt} \quad - \text{trade weights}$$

Foreign interest rate ( $r^*$ )

$$r_{it}^* = \sum_{j=1}^N \omega_{ij}^F r_{jt} \quad - \text{financial weights}$$

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## Global variables - $D_t$

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Brent oil prices

$$f_t = \ln(BO_t)$$

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Sources: IFS IMF, OECD, National sources

# The Data (3)

- Trade-weight matrix – for foreign output
  - Time-varying (year-specific)
  - Annual bilateral flows of exports plus imports in USD
  - Source: IMF Direction of Trade Statistics (DOTS)

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- Trade-weight matrix – for foreign output
  - Time-varying (year-specific)
  - Annual bilateral flows of exports plus imports in USD
  - Source: IMF Direction of Trade Statistics (DOTS)
  
- Financial-weight matrix – for foreign interest rate
  - Time-varying (4-year period average)
  - Stocks of cross-border holdings of equities and long- and short-term debt securities (assets plus liabilities)
  - Source: IMF Coordinated Portfolio Investment Survey (CPIS)

# Model Setup

- Stationarity

- 38 out of 209 series – I(0)
- 183 out of 209 series – I(1)

- Lag length

- $p = 1$  and  $q = 1$  (degrees of freedom considerations)

- Cointegration

- Trace statistics for rank selection (1 to 3 cointegration equations)
- LR test for the type of deterministic (case II-IV)

- Weak exogeneity

- 72 out of 87 variables (F-test at 5% significance level)

- No residual serial correlation

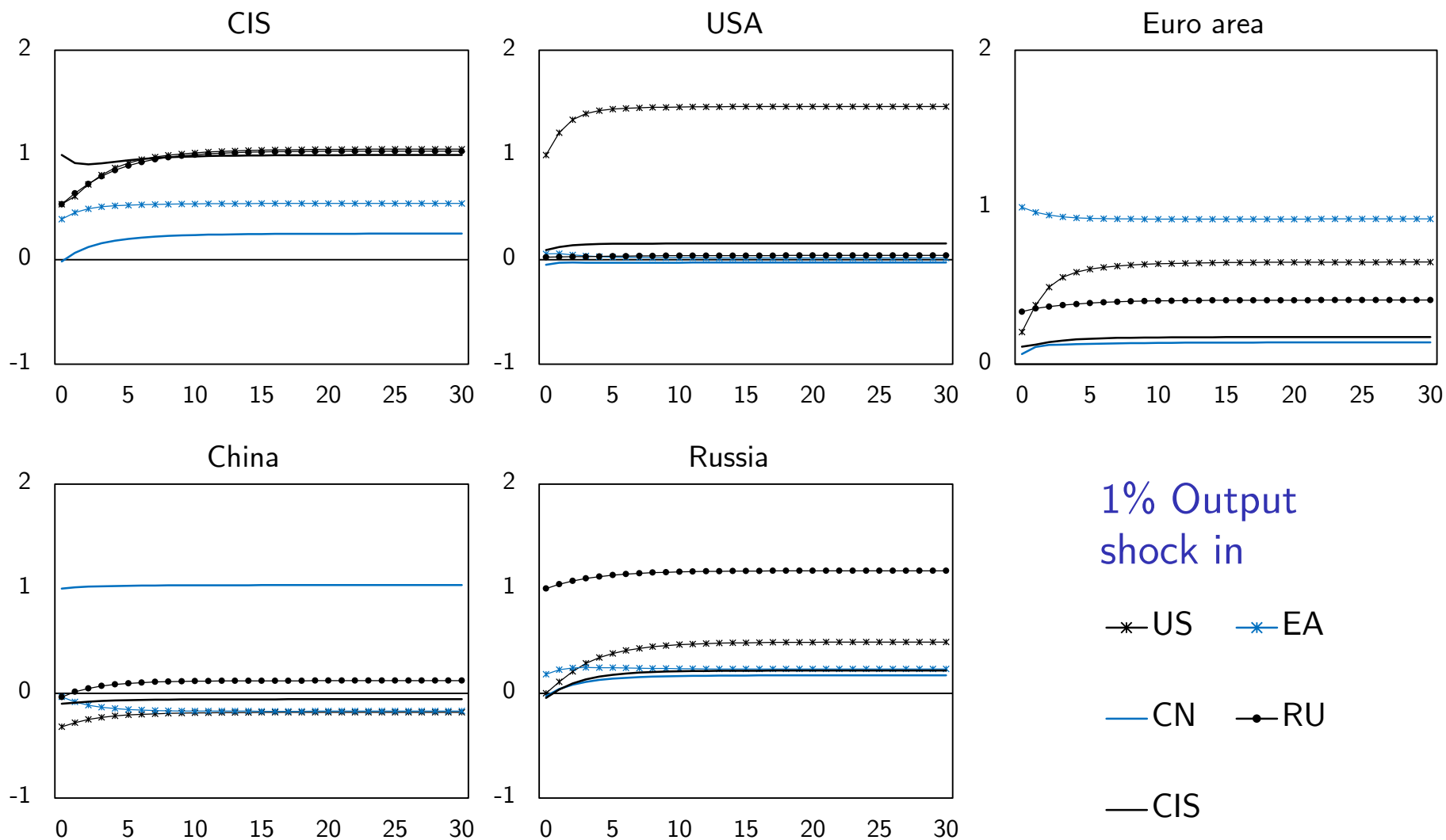
- 87 out of 119 equations (F-test at 5% significance level)



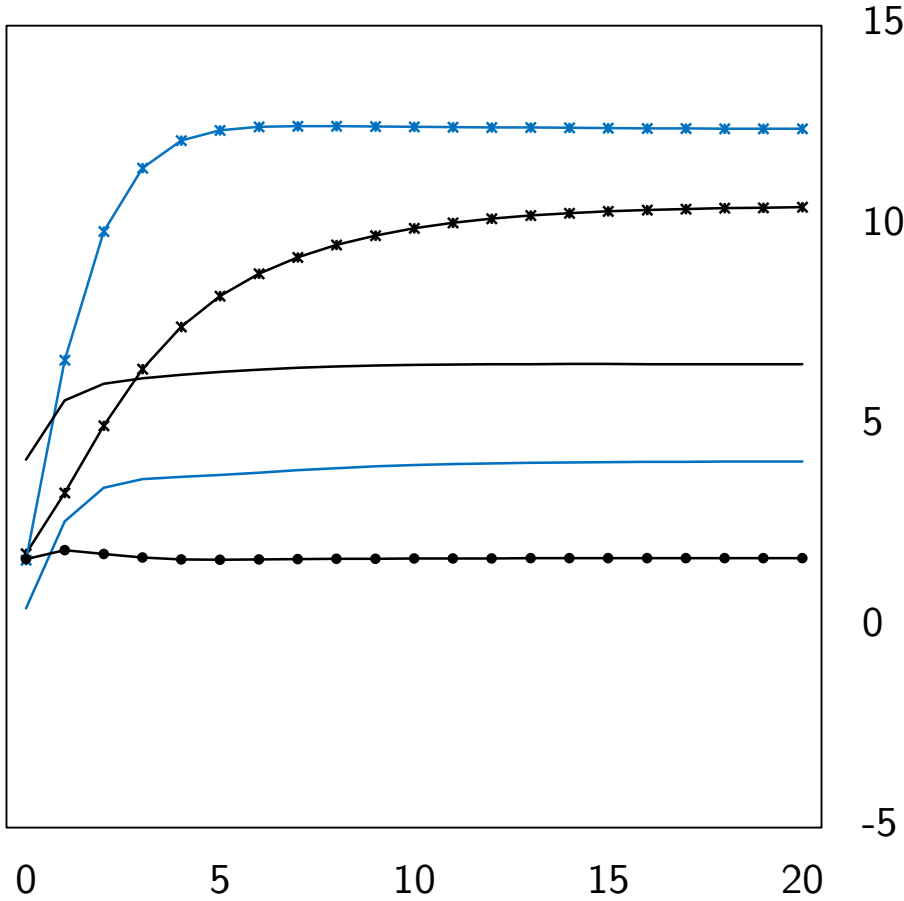
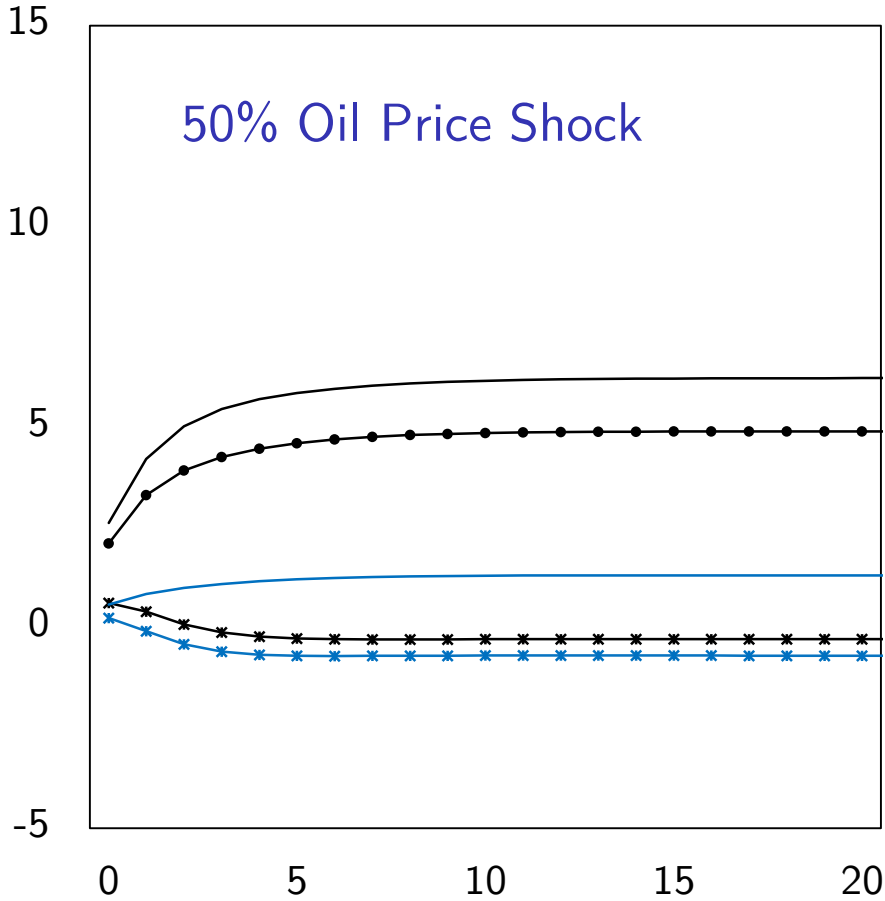
# Results

- Generalized Impulse Response Function (GIRF) as in [Pesaran and Shin \(1998\)](#)
  - Insensitive to ordering of variables
  - Incorporating the weak exogeneity assumption allows the identification of country-specific structural shocks
- Shocks scenarios:
  - 1% USA output
  - 1% euro area output
  - 1% Chinese output
  - 1% Russian output
  - 1% CIS output
  - 50% oil price
- 4 periods for solution matrices:
  - 2001-2004
  - 2005-2008
  - 2009-2012
  - 2013-2016

# Output Shocks: average weights



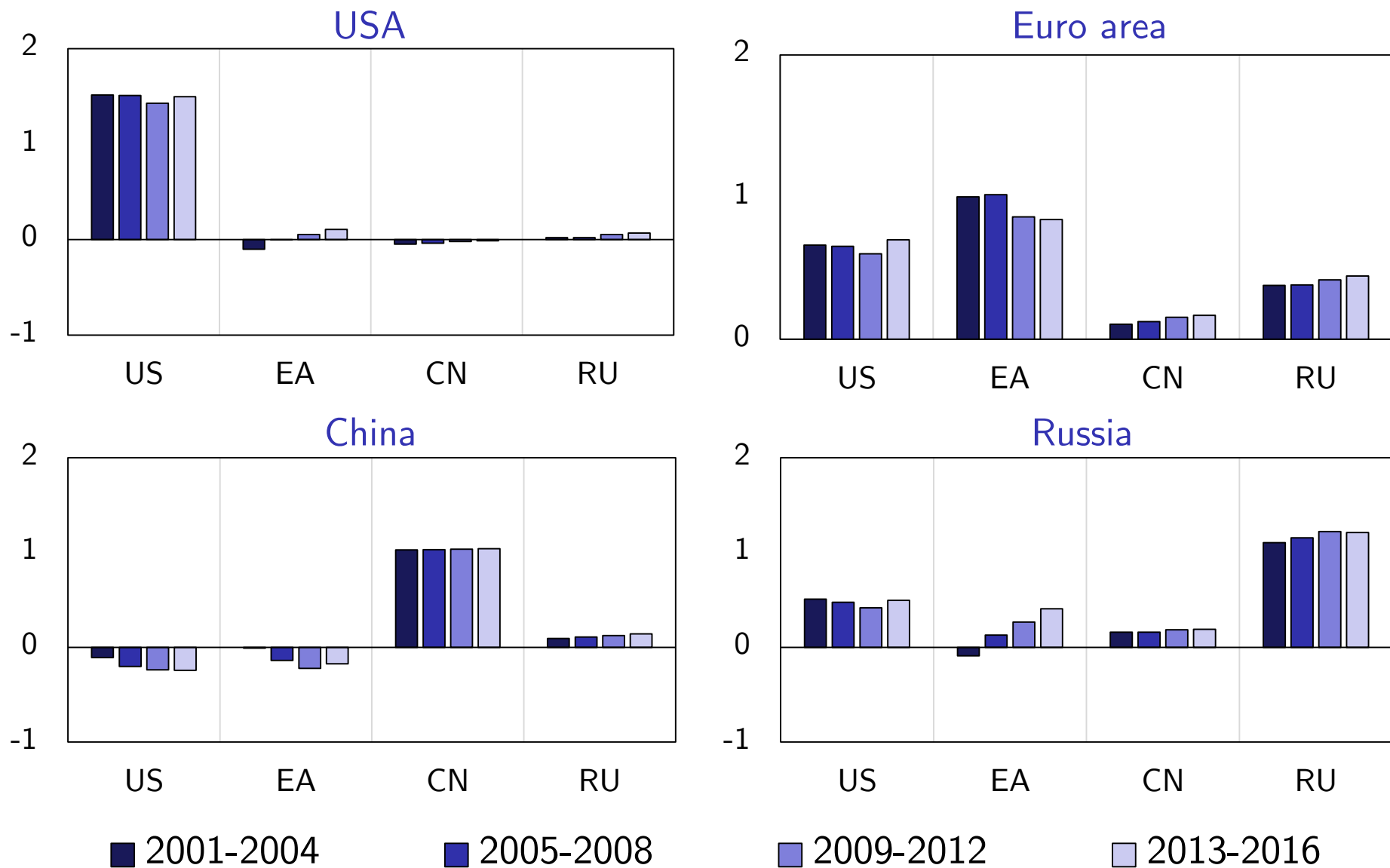
# Oil Price Shock: average weights



\* USA    \* EURO    — CHINA  
 • RUSSIA    — CIS

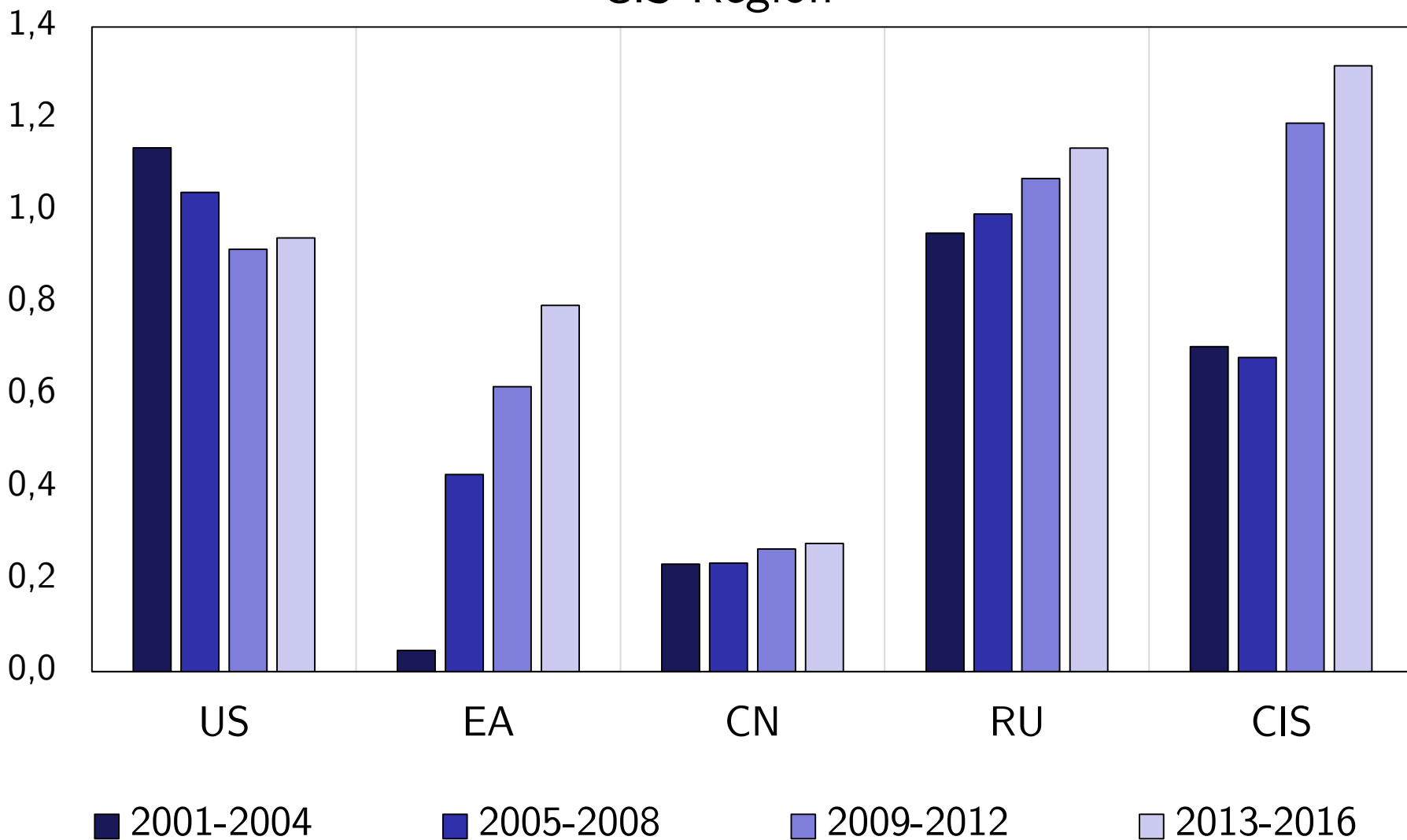
\* AZERBAIJAN    \* BELARUS  
 — GEORGIA    • KAZAKHSTAN  
 — UKRAINE

# Output Shocks: time-varying weights



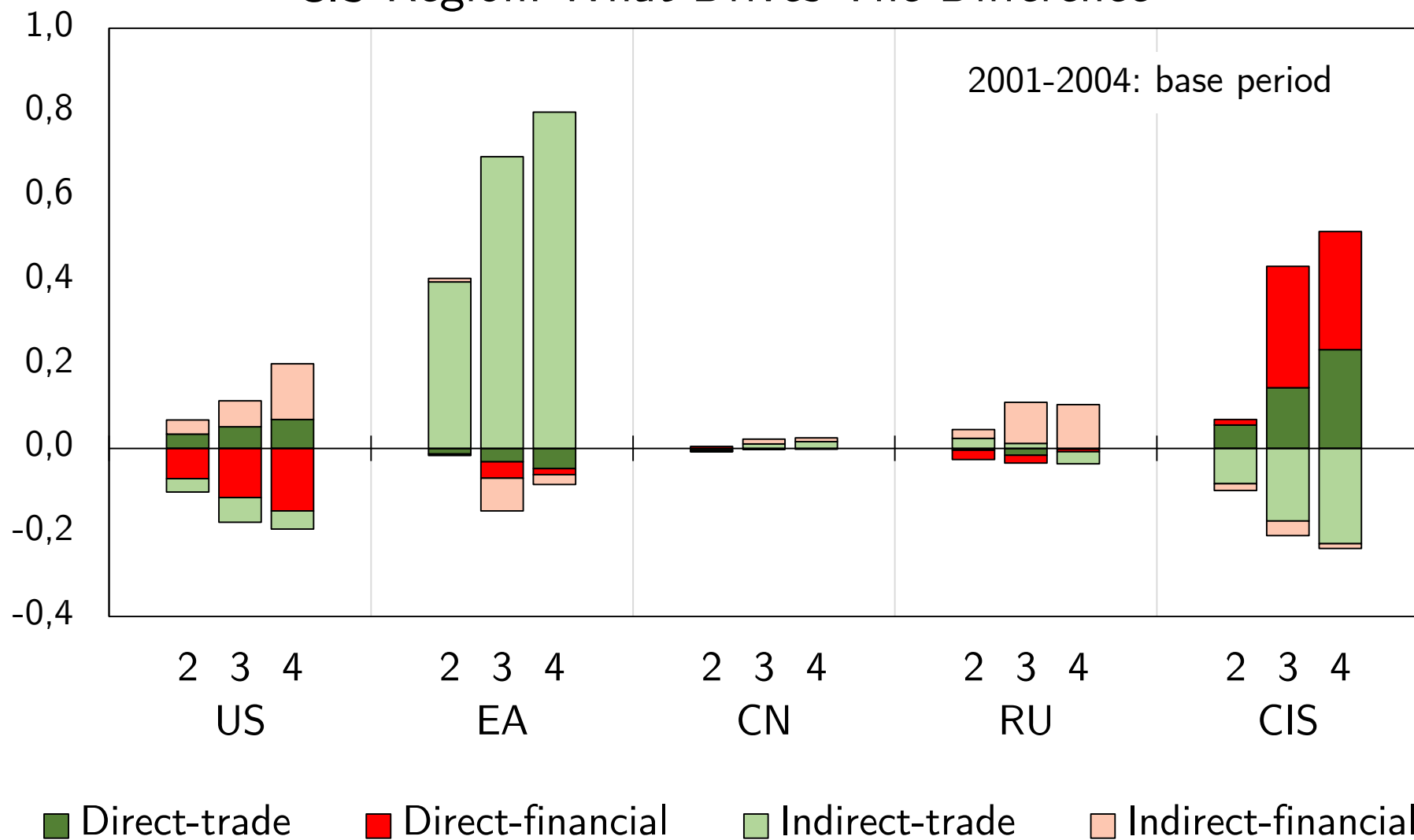
# Output Shocks: time-varying weights

## CIS Region



# Output Shocks: decomposition

## CIS Region: What Drives The Difference



# Oil Price Shock: time-varying weights



# Key Messages (1)

- CIS's response to foreign shocks has changed dramatically over past decades
- The **US** plays a dominant role in the world economy and for CIS in particular, but the effect is declining
- **Russia** remains being one of the major driver for CIS and the effect is increasing
- Moderate response to **Chinese** shocks despite the growing importance of China in the global arena

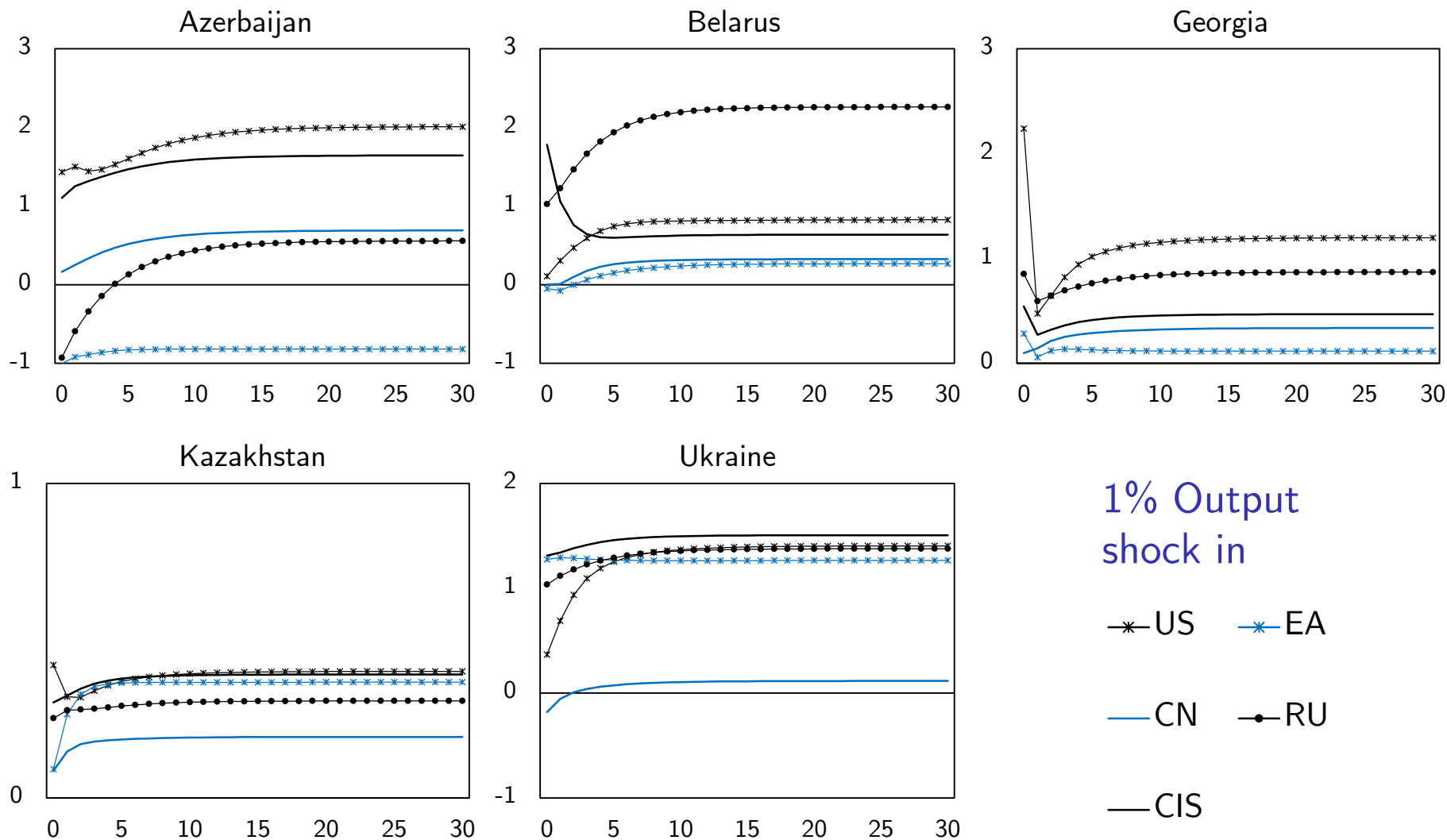


## Key Messages (2)

- The response to **euro area** shocks increased substantially due to changes in the trade composition of other countries
- The response to **regional** shocks after the GFC has almost doubled due to changes in CIS's trade and financial relations
- CIS are relatively more sensitive to the **oil price** shock and the effect is increasing

# Appendix

# Output Shocks: average weights – CIS individual

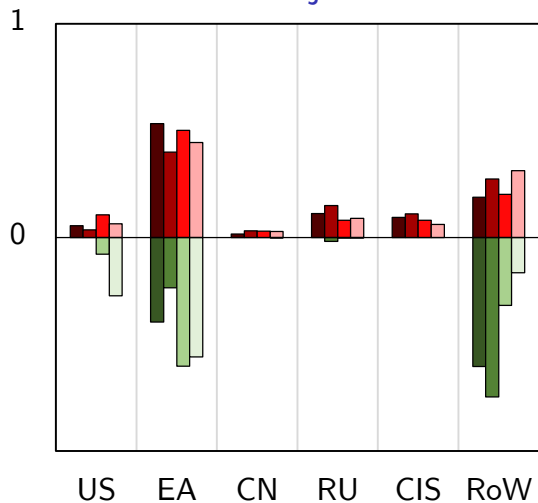


1% Output shock in

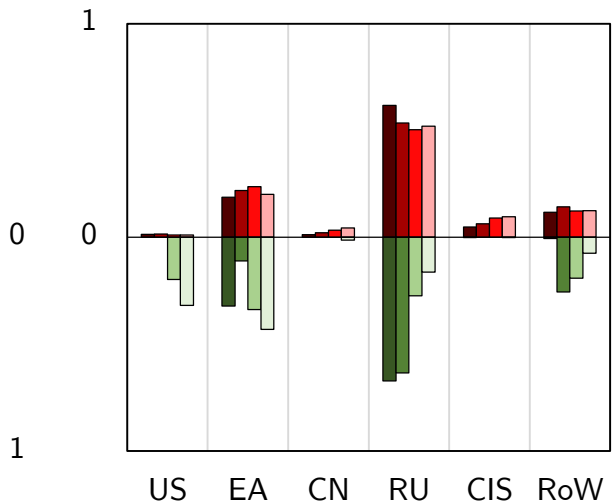
- \*— US    \*— EA
- CN    —●— RU
- CIS

# Trade and financial linkages – CIS individual

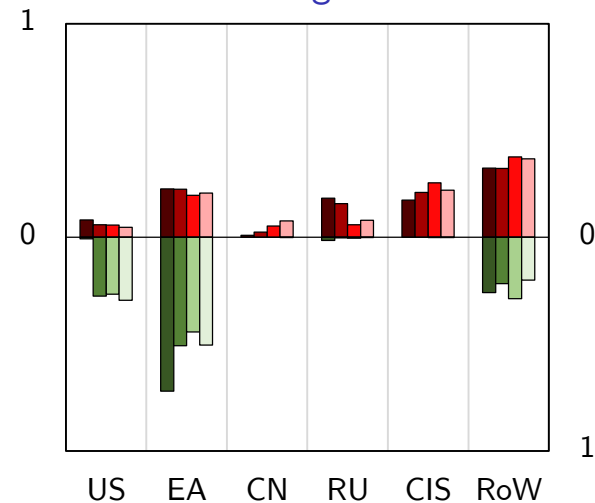
Azerbaijan



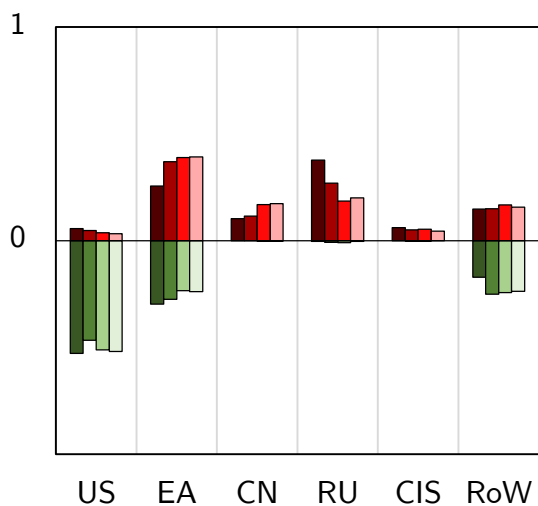
Belarus



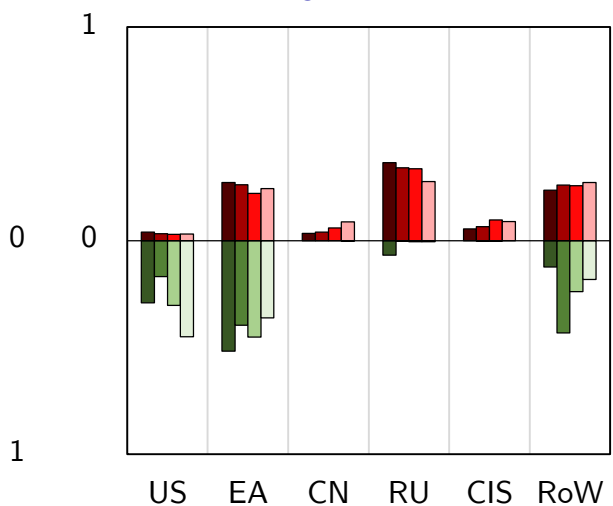
Georgia



Kazakhstan

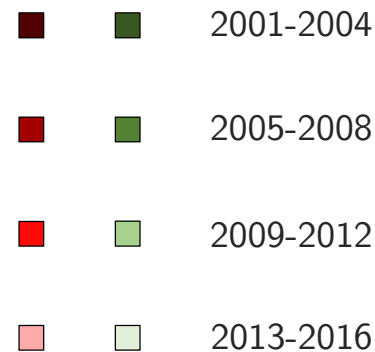


Ukraine



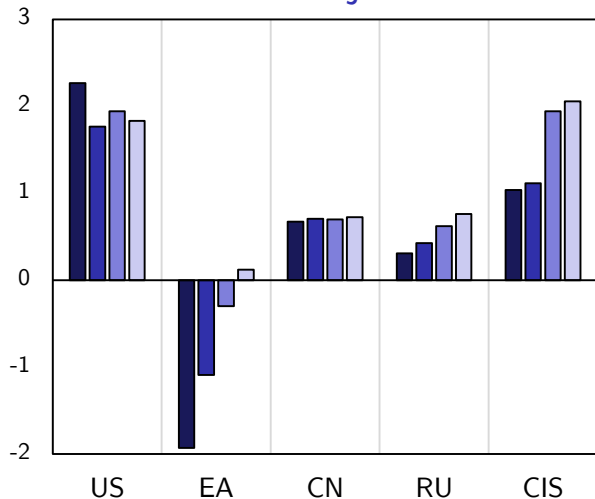
Trade (left - red)

Financial (right - green)

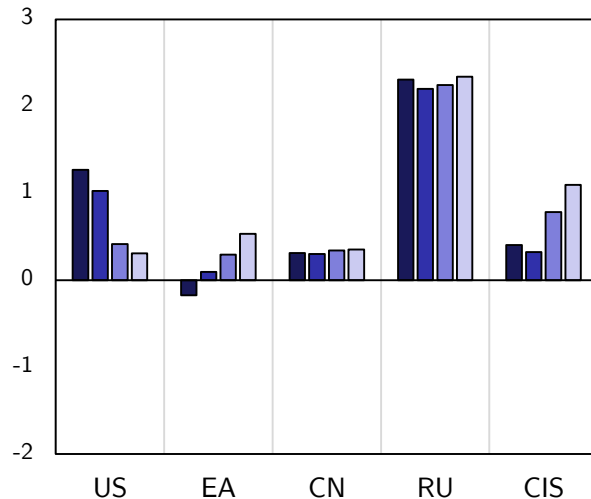


# Output Shocks – CIS individual

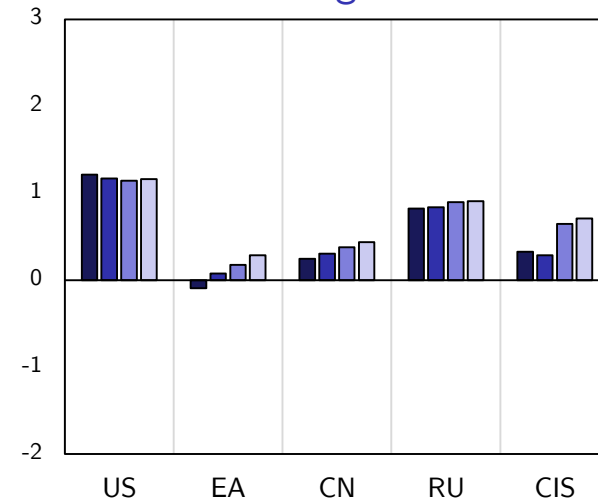
Azerbaijan



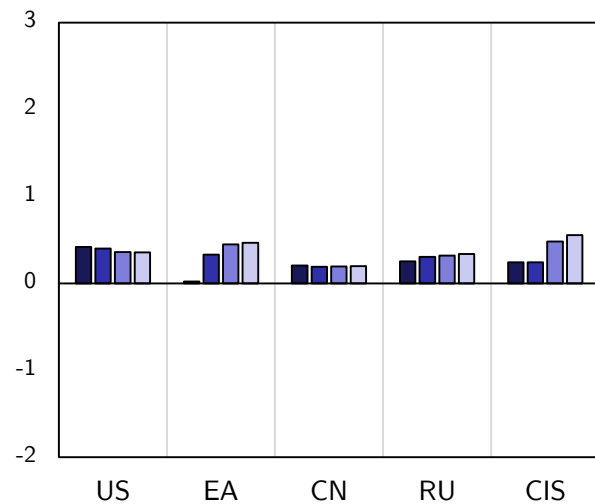
Belarus



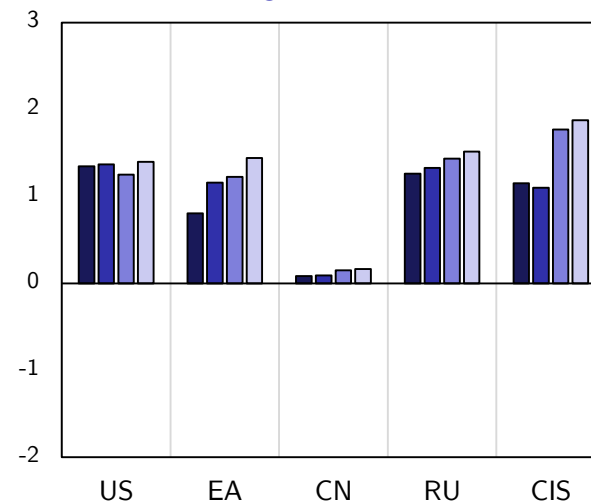
Georgia



Kazakhstan



Ukraine



1% output shock

- 2001-2004
- 2005-2008
- 2009-2012
- 2013-2016

# Oil Price Shock: CIS individual

